

1 **Changes in body size of Canadian Pacific salmon over six decades**

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16 Running title: Salmon body size over six decades

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18

19 Abstract

20 Body size can sometimes change rapidly as an evolutionary response to selection or as
21 a phenotypic response to changes in environmental conditions. Here, we revisit a
22 classic case of rapid change in body size of five species of Pacific salmon
23 (*Oncorhynchus*) caught in Canadian waters, with a six-decade analysis (1951-2012).
24 Declines in size at maturity of up to 3 kg in Chinook (*O. tshawytscha*) and 1 kg in coho
25 salmon (*O. kisutch*) during the 1950s and 1960s were later reversed to match or exceed
26 earlier sizes. In contrast, there has been little change in sockeye salmon (*O. nerka*)
27 sizes and initial declines in pink (*O. gorbuscha*) and chum salmon (*O. keta*) sizes have
28 halted. Biomass of competing salmon species contributed to changes in size of all five
29 species, and ocean conditions, as reflected by the North Pacific Gyre Oscillation and
30 the Multivariate ENSO indices, explained variation in four of the species. While we have
31 identified a role of climate and density dependence in driving salmon body size, any
32 additional influence of fisheries remains unclear.

33

34 **INTRODUCTION**

35 Across biomes and for a variety of reasons, many animals have been becoming
36 smaller (Allendorf and Hard 2009, Gardner et al. 2011). Changes in body size have a
37 myriad of consequences. They affect the physiology (Gardner et al. 2011, Ohlberger
38 2013) and ecology (Peters 1983, Audzijonyte et al. 2013) of an organism and can affect
39 correlated life-history traits such as fecundity and survival (Blueweiss et al. 1978, Calder
40 1984). In marine fishes, changes in body size have been linked to oceanic conditions
41 (Satterthwaite et al. 2012, Crozier and Hutchings 2013), competition (Helle et al. 2007),
42 and size-selective fisheries (reviewed in Law 2000, Hard et al. 2008). Whatever the
43 cause, these morphological changes can occur quickly (Law 2000, Conover and Munch
44 2002), reduce yields to fisheries, and threaten the sustainability of exploited fish stocks
45 (Baker et al. 2011).

46 Pacific salmon provided early examples of this global trend in declining body size.
47 Between 1951 and 1975, three of these iconic species, Chinook (*Oncorhynchus*
48 *tshawytscha*), coho (*O. kisutch*), and pink salmon (*O. gorbuscha*), caught in British
49 Columbia (BC), Canada, became significantly smaller (Ricker 1981). The decline in
50 body size of these species was muted between 1975 and 1991, especially for northern
51 and central coastal populations (Ricker 1995). In contrast, the body sizes of chum (*O.*
52 *keta*) and sockeye (*O. nerka*) salmon changed little over those four decades (Ricker
53 1981, 1995). The BC trend in declining body size was mirrored across North America
54 and Asia where the average body size in 45 of 47 North Pacific salmon populations
55 decreased between 1975 and 1993 (Bigler et al. 1996).

56 Oceanic conditions have been hypothesized to affect salmon body size trends
57 through variability in environmental conditions and abrupt changes across ecosystem
58 regime shifts (Helle and Hoffman 1998, Wells et al. 2006, Helle et al. 2007).

59 Environmental variability can be represented by climatic indices. These indices reflect
60 metrics of pelagic productivity, such as net primary productivity, chlorophyll
61 concentrations, and nutrient levels (Di Lorenzo et al. 2008), across the broad
62 geographic scales experienced by salmon during marine migrations (Wells et al. 2006,
63 Di Lorenzo et al. 2008, Satterthwaite et al. 2012). Salmon body size has also been
64 found to vary across more abrupt ecosystem regime shifts (Helle and Hoffman 1998).
65 These regime shifts are characterized by rapid, substantial changes in ecosystem
66 dynamics, including community composition and trophic structure (Polovina 2005).
67 Climate-related shifts in salmon abundance in the North Pacific Ocean have been
68 associated with major ecosystem regime shifts in c. 1947, 1977, and 1989 (Irvine and
69 Fukuwaka 2011).

70 Body size of Pacific salmon is also influenced by density-dependent interactions
71 such as competition (Kaeriyama 1998, Ruggerone et al. 2012), presumably from the
72 most abundant species, sockeye, chum, and pink salmon (Irvine and Fukuwaka 2011).
73 High biomass of these salmonids can be expected to correspond to smaller body sizes
74 due to food resource limitations (Sebens 1987). Eggers and Irvine (1997) found that
75 average body size for many populations of sockeye salmon was inversely related to
76 aggregate abundance, implying that growth was density-dependent. Pink salmon may
77 be especially influential in density-mediated changes in body size due to their numerical
78 abundance (Irvine and Fukuwaka 2011) and their life history (Ruggerone and Nielsen

79 2005). For instance, pink salmon fry enter the ocean early and may reduce prey
80 availability for the salmonids that follow. Their competitive ability is further strengthened
81 by their high consumption rate and their strong diet overlap with sockeye and chum
82 salmon (Healey 1980, Ruggerone and Neilson 2005). Bugaev et al. (2001) estimated
83 that high abundance of pink salmon could reduce the body size of sockeye salmon
84 returning to Ozernaya River, Russia by up to half. Although pink salmon are numerically
85 the most abundant species of Pacific salmon, the second most abundant species, chum
86 salmon, has a greater biomass as they are larger and stay in the ocean longer.
87 Consequently, chum, pink, or a combination of these and other species may be
88 important for inter- and intraspecific density-dependent interactions.

89 Finally, body size has also been observed to respond quickly to intensive fishing
90 in both natural populations (reviewed in Hard et al. 2008) and in selection experiments
91 (reviewed in Pauli and Heino 2014). Fisheries can act as a source of strong, directional
92 selection on phenotypic traits by causing high levels of mortality and targeting certain
93 size-classes (e.g., through gear selectivity and minimum catch limits) (Law 2000,
94 Hutchings and Fraser 2008). Such changes have been observed across taxa (e.g.,
95 Hamon et al. 2000, Haugen and Vøllestad 2001) and regions (e.g., Ricker 1995, Hyer
96 and Schleusner 2005).

97 Here, we examine trends in body size of Pacific salmon over the past six
98 decades. We extend Ricker's 1981 and 1995 classic analyses on Pacific salmon in two
99 important ways: (1) we lengthen the time series by 21 years such that it now spans the
100 years 1951-2012, and (2) we use generalized additive mixed models (GAMMs), which
101 were unavailable to Ricker, to test the importance of potential correlates of changes in

102 body size. The principal advantage of GAMMs is that they allow the data to dictate the
103 structure of the fit while accounting for a temporal correlation structure (Hastie and
104 Tibshirani 1990, Lin and Zhang 1999). This is critical in evaluating the influence of
105 chronic forcing variables, such as climate change, as they are predicted to cause non-
106 linear ecosystem changes (Smith et al. 2009). We include potential effects of oceanic
107 conditions by considering time-series of four climatic indices - the Pacific Decadal
108 Oscillation, the North Pacific Gyre Oscillation, the Northern Oscillation Index, and the
109 Multivariate ENSO Index. We examine the effect of density-dependent interactions by
110 including estimates of the biomass of potentially competing North American sockeye,
111 pink, and chum salmon, as well as chum salmon from Asia. Finally, we test for a
112 latitudinal effect by including the latitude of each fishery's capture location (i.e. statistical
113 area) as a potential factor in our analyses.

114

115 **METHODS**

116 **Data sources: Body Size Fishery Data**

117 We calculated average body size from British Columbia (BC) commercial catch
118 statistics for populations of pink, chum, sockeye, coho, and Chinook salmon for each
119 year between 1951 and 2012. The BC commercial catch can include a considerable
120 proportion US-bound fish, especially in the case of Chinook and coho salmon caught in
121 troll fisheries off the west coast of Vancouver Island (Pacific Salmon Commission 2004;
122 Pacific Salmon Commission 2015). However, at least for Chinook salmon, the
123 proportion of US origin fish appears to be relatively stable over time (Pacific Salmon
124 Commission 2015), minimizing any confounding effects on our analyses. The weight of

125 the commercial catch and the total number of fish caught are recorded for 29 statistical
126 areas spanning the BC coastline (Area 1- Area 29; [http://www.pac.dfo-mpo.gc.ca/fm-](http://www.pac.dfo-mpo.gc.ca/fm-gp/maps-cartes/areas-secteurs/index-eng.html)
127 [gp/maps-cartes/areas-secteurs/index-eng.html](http://www.pac.dfo-mpo.gc.ca/fm-gp/maps-cartes/areas-secteurs/index-eng.html)). We calculated average body size by
128 dividing the weight of the catch by the number of fish caught. In a series of technical
129 reports, Ricker and colleagues (Ricker et al. 1978, Ricker 1980a, 1980b, 1982, Ricker
130 and Wickett 1980) computed average body sizes as described above for all species of
131 Pacific salmon across BC fisheries from 1951 to 1975. Ricker (1995) extended some of
132 these time series to 1991. We extended all of them to 2012. Round (live) weight is
133 reported in the commercial catch statistics for gillnet- and seine-caught fish. In contrast,
134 dressed weight (completely cleaned but with the head on) is reported for troll-caught
135 fish. Following Ricker and colleagues (Ricker et al. 1978, Ricker 1980a, 1980b, 1982,
136 Ricker and Wickett 1980), we converted dressed weight to round weight by multiplying
137 by 100/85 (Ricker 1995). Ricker et al. also imposed minimum annual catch weights for
138 body size calculations because small catches might produce unreliable average weights.
139 We imposed the same restrictions for the years 1951 – 1975 and set the annual catch
140 minimum to 10,000 lbs (4,536 kg) for the years 1976 – 2012. We were able to
141 accurately replicate the average weights calculated in the technical reports by Ricker
142 and his colleagues and are thus confident that the methods used before and after 1975
143 are similar.

144

145 **Data sources: Oceanic Conditions**

146 To represent oceanic conditions, we considered both acknowledged regime
147 shifts and continuous variability. There were three ecosystem regime shifts during our

148 study period (1976/77, 1988/89, 1998/99) that are generally regarded as being
149 characterized by sudden substantial changes in community composition, including
150 species abundances and trophic structure (Polovina 2005). On the other hand, climatic
151 indices integrate continuous variability in oceanic conditions (e.g., sea surface
152 temperature, sea level pressure) experienced by salmon and other species across
153 broad geographic scales. The climatic indices recognized to have the most generalised
154 effects across salmon populations and species are the Multivariate ENSO Index (MEI;
155 available from www.esrl.noaa.gov/psd/enso/mei/), the Pacific Decadal Oscillation (PDO;
156 available from research.jisao.washington.edu/pdo/), and the Northern Oscillation Index
157 (NOI; available from
158 <http://www.pfeg.noaa.gov/products/PFEL/modeled/indices/NOIx/noix.html>) (Wertheimer
159 et al. 2004, Wells et al. 2006, Satterthwaite et al. 2012). We also included a fourth
160 index, the North Pacific Gyre Oscillation (NPGO), due to recent evidence indicating that
161 salmon survival since the 1980s is better explained by the NPGO than the PDO (Kilduff
162 et al. 2015; available from www.o3d.org/npgo).

163 The MEI measures the intensity of the El Niño Southern Oscillation (ENSO) by
164 integrating six metrics of environmental variability (sea surface temperature, surface air
165 temperature, sea-level pressure, zonal and meridional surface winds, and cloud cover)
166 (Wolter and Timlin 1998). An increase in MEI (warmer, ENSO-like conditions)
167 corresponds to a decrease in net primary productivity and chlorophyll biomass
168 (Behrenfeld et al. 2006). MEI has been shown to correlate negatively with the average
169 length of age-3 coho salmon returning to rivers from BC south to California. In contrast,
170 the relationship of MEI with average length of age-3 Chinook is variable (positive for

171 salmon returning to BC; negative for salmon returning to Washington, Oregon, and
172 California) (Wells et al. 2006). While other indices measure the occurrence of El Niño
173 and La Niña episodes and related ENSO impacts (e.g., Southern Oscillation Index,
174 North Pacific Index, Oceanic Niño Index), we chose the MEI because of its documented
175 influence on salmon body size and because it is based on more information than other
176 ENSO indices (Wolter and Timlin 1998).

177 The PDO is the dominant pattern of sea surface temperature (SST) variability in
178 the North Pacific Ocean and captures long-term temperature trends that persist for 20-
179 30 years. The PDO is often positive in El Niño years and is associated with climatic
180 regime shifts manifesting in changes in trophic structure and availability of prey fish
181 (Mantua et al. 1997; Mantua & Hare 2002; Wells et al. 2006; Beamish et al. 1999).
182 Negative values of the PDO (cooler conditions) correspond with higher abundance of
183 Pacific salmon in the southern portion of their eastern Pacific range, while the inverse is
184 true in Alaska (Hare et al. 1999; Hare & Mantua 2000). Furthermore, the sizes of coho
185 and Chinook salmon south of Alaska are negatively correlated with the PDO (Wells et al.
186 2006)

187 The NOI represents the difference in sea level pressure anomalies from two
188 locations that influence atmospheric circulation – the North Pacific High off the coast of
189 California (high pressure region) and near Darwin, Australia (low pressure region)
190 (Schwing et al. 2002). This index is correlated negatively with ocean temperatures.
191 Positive values of the NOI would be expected to increase salmon body size, as more
192 nutrients are available through stronger trade winds and increased upwelling (Schwing
193 et al. 2002). Mean length of two ocean-winter Chinook and age 3 coho salmon from

194 Washington, Oregon and Californian was higher with positive NOI values (Wells et al.
195 2006, Satterthwaite et al. 2012). However, the influence of NOI may not be consistent
196 across latitudes as positive NOI periods correspond with higher salmon catches in the
197 Pacific Northwest and lower salmon catches in Alaska (Schwing et al. 2002).

198 Finally, the NPGO represents variability in ocean circulation in the Northeast
199 Pacific Ocean (Di Lorenzo et al. 2008). Strengthening of subpolar and subtropical gyres
200 is reflected in positive values of the NPGO and fluctuations correspond to variability in
201 the horizontal flow of seawater and wind-driven upwelling (Di Lorenzo et al. 2008). The
202 NPGO is positively correlated with salinity, nutrient concentrations, chlorophyll levels,
203 and salmon abundance (Di Lorenzo et al. 2008, Kilduff et al. 2015). Furthermore, the
204 NPGO accounted for substantial variation in survival of juvenile Chinook in the Snake
205 River, Wyoming (Miller et al. 2014).

206 Salmon body size is likely to respond to wintertime oceanic indices summarizing
207 atmospheric circulation as this period has been credited for the physical changes seen
208 in the North Pacific Ocean (Mantua et al. 1997, Yeh et al. 2011). As with Litzow et al.
209 (2014), we included only winter values of the PDO and the NPGO by averaging monthly
210 values from November to March (as per convention for each index) and assigning the
211 winter values to the fish growth year that included March. We included only December
212 to May values of the NOI as they have the greatest and most lasting effect in the
213 Northeast Pacific Ocean. We lagged annual mean values of the MEI by one year to
214 align oceanic conditions experienced by salmon with the propagation of the ENSO
215 signal into our study region (Litzow et al. 2014).

216

217 **Data sources: Density effects**

218 To evaluate the effect of competition and density-dependent interactions, we
219 included three estimates of salmon biomass as covariates in our model: (1) the total
220 biomass of chum salmon, (2) the total biomass of pink salmon, and (3) the combined
221 total biomass of sockeye, chum, and pink salmon (in millions of kg, from BC, WA, and
222 from Alaskan rivers entering the Gulf of Alaska, GOA). No model was allowed to
223 include more than one biomass index. Since the marine distribution of BC salmon also
224 overlaps with Asian salmon, in particular chum salmon (Myers et al. 2007, Urawa et al.
225 2009), we also included the total biomass of potentially competing Asian chum salmon
226 to test if it improved model support for BC chum salmon size.

227 Total biomass included the biomass of younger salmon in the ocean as well as
228 older returning mature salmon. The biomass of mature salmon only was estimated by
229 Irvine and Ruggerone (2016) by multiplying numerical run size (i.e. catch +
230 escapement) estimates for groups of sockeye, pink, and chum salmon from Ruggerone
231 and Irvine (2015) by individual fish weights, which were computed by dividing catches in
232 numbers by catches in weights (data from
233 http://www.npafc.org/new/science_statistics.html). Irvine and Ruggerone (2016) applied
234 species-specific ratios of total biomass to the biomass of mature salmon only from
235 Eggers (2009) to yield the total biomass estimates of young and mature salmon that we
236 used in our analyses.

237

238 **Biological Considerations**

239 Because our fish size data were from fish caught in fisheries, we assumed that
240 fish were mature, fully grown individuals returning to fresh water to spawn. However,
241 this may not be accurate for troll-caught Chinook and coho salmon as they can be
242 caught prior to their return migration when they are still growing (Ricker 1981). For
243 these species, a temporal shift in fishing effort could alter the mean weight of fish
244 caught that year, as the catch may be composed of fish at different stages of growth.
245 For the purposes of this analysis, we assumed that the monthly distribution of catches
246 was similar among years to allow a comparison of annual mean weights in these
247 species. We also included latitude as a factor in the analysis, which should help account
248 for any such shifts if they occurred and if their effects were strong for those two species.
249 Furthermore, time series were fairly evenly distributed among regions (Fig. S2b). In
250 contrast, pink, chum, and sockeye salmon are generally caught after the completion of
251 most of their growth (Ricker 1981). In the case of pink salmon, which has a two-year
252 lifecycle, odd- and even-year fish were treated as separate populations as they are
253 genetically distinct (Irvine et al. 2014).

254

255 **Analyses**

256 We ran all analyses on salmon caught by the least selective gear (i.e., troll for
257 Chinook and coho salmon and seine for chum, pink, and sockeye salmon) to minimize
258 the potential for gear size-selectivity to dictate observed changes in body size. We are
259 confident that the body size trends observed in the British Columbia catch statistics are
260 not artifacts of the fishery as temporal trends were similar across all gear types (Fig. S1).
261 We only included time series from a statistical area if there were more than 20 years of

262 body size data (10 years for odd- and even-year pink salmon). Missing data were
263 mainly due to years with no fishery in the region or with annual catches that were less
264 than the required minimum weight for inclusion. Time series for each species were, in
265 general, evenly distributed among gear types (Fig. S2a) and regions (Fig. S2b). To
266 examine overall trends in body size, we used local polynomial regression smoothing
267 (loess) to plot a smoothed mean and 95% confidence interval of the mean through
268 average weight data for each species caught in all statistical areas across BC.

269 We used generalized additive mixed models (GAMMs) to evaluate the
270 importance of climatic indices and biomass estimates on body size. We controlled for
271 spatial effects by including latitude as a covariate in the model. Generalized additive
272 models are an extension of generalized linear models that allow for both semi-
273 parametric (smoothed) and parametric linear terms as predictor variables (Hastie and
274 Tibshirani 1990). Generalized additive models permit departure from the common
275 statistical assumption of linearity by allowing the data to dictate a non-linear structure of
276 the fit. Generalized additive mixed models are an extension of generalized additive
277 models that allow for the inclusion of correlation structures (Lin and Zhang 1999).

278 We centered time series from each statistical area and each species by the
279 mean to allow compilation across areas. We averaged each climatic index (NPGO,
280 PDO, MEI and NOI) and biomass estimate (pink only, chum only, total pink, chum, and
281 sockeye) over the average number of ocean winters of each species (i.e., coho and pink
282 salmon: one year, sockeye salmon: two years, chum and Chinook salmon: three years).
283 We also calculated the latitudinal midpoint of each statistical area to test for a latitudinal
284 gradient in changes in body size.

285 To evaluate the effect of competition and density-dependent interactions, we
 286 included an estimate of the combined biomass of competing sockeye, chum, and pink
 287 salmon (in millions of kg) from BC, WA and from Alaskan rivers entering the GOA as a
 288 potential covariate of salmon body size. We also included an estimate of only pink
 289 salmon biomass and only chum salmon biomass. Only one biomass estimate – biomass
 290 of competing pink, chum, or the combined total of pink, chum, and sockeye salmon
 291 biomass – was included in any given model due to non-independence. We included the
 292 biomass of chum salmon from Asia in the top model for chum salmon by adding it to the
 293 GOA, BC, and WA biomass estimate to determine if Asian chum have an additional
 294 effect on BC chum body size. Collinear variables, as defined by variance inflation
 295 factors > 5 and Pearson's R correlation coefficients > 0.8, were not permitted in the
 296 same model (Table S1; Zurr et al. 2007). No climatic indices exceeded our thresholds
 297 for collinearity (Table S1).

298 We fit a separate GAMM to each species of the form:

$$299 \quad Y = \beta_0 + \sum_{k=1}^n S_k(x_k)$$

300 where Y is the mean weight of salmon in kilograms, β_0 is the intercept term and

301 $\sum_{k=1}^n S_k(x_k)$ is the sum of each smoothed explanatory variable, where S_k is a one-

302 dimensional smoothing function of the x_k explanatory variable. The degrees of freedom

303 associated with each term dictate the degree of smoothing. We set the maximum

304 degrees of freedom for each parameter to four to prevent overfitting and spurious

305 results (Guntenspergen 2014). Under this constraint, the effective degrees of freedom

306 were determined using cross-validation. A parameter with one effective degree of

307 freedom is essentially reduced to a linear term. A thin-plate regression spline function
308 was used to smooth each variable x_k .

309 An autoregressive moving average (ARMA) correlation structure was fitted to
310 each GAMM to account for temporal autocorrelation. The autoregressive order (p) and
311 the moving average order (q) of the ARMA structure were selected by minimizing the
312 Akaike information criterion. We report the best models that can be constructed from the
313 climatic indices, biomass estimates, and latitudinal gradient as determined by
314 minimizing the second-order Akaike information criterion (AICc). The AICc imposes a
315 larger penalty for additional model terms than the AIC with a correction for finite sample
316 sizes. We report the best supported models as those with an AICc deviation from the
317 top model (ΔAICc) less than two (Burnham and Anderson 2002).

318 Partial plots of each explanatory variable included in the top model are presented
319 (with 95% confidence intervals) to visualize the relationship between the smoothed
320 explanatory variable and residualized and mean-centered body size (i.e., mean-
321 centered body size after removing the effect of all other explanatory variables).
322 Consequently, the plots represent how body size changes relative to its mean for a
323 given explanatory variable.

324

325 **RESULTS**

326 The mean weight of all species of Pacific salmon caught in the BC commercial
327 catch changed over time (Figs. 1 and 2). The mean weight of Chinook salmon declined
328 markedly, by approximately 3 kg, from 1951 to the early 1970s, but this decline was
329 then mirrored by an increase of weight back to its former mean through the 1980s and

330 1990s (Fig. 2a). The body size of coho salmon followed a similar pattern; however, the
331 minimum body size of coho salmon was not reached until the 1990s before rebounding
332 (Fig. 2b). Chum, odd- and even-year pink salmon initially declined in body size with little
333 change over the past two decades (Fig. 2c, e, f). There was relatively little change in the
334 body size of sockeye salmon (Fig. 2d).

335 Visual examination of unsmoothed trends indicated no obvious, consistent effect
336 of abrupt climate-related regime shifts on salmon body size (Fig. 1). However,
337 continuous climatic indices, combined with an estimate of salmon biomass as a proxy
338 for competition, were more informative. The best statistical models of salmon body size
339 variability invoked at least two climatic indices for each species. The top models
340 explained substantial variation in even- and odd-year pink salmon body size ($R^2 = 0.40$
341 and 0.70 , respectively), and moderate variation in chum, and Chinook salmon body size
342 ($R^2 = 0.23$ and 0.21 , respectively; Table 1). The best model explained minimal variation
343 in sockeye and coho salmon body size ($R^2 = 0.10$ and 0.16 , respectively; Table 1).
344 There was little evidence of a latitudinal effect, as latitude was not present in any of the
345 top models (Table 1) and trends in body size were not drastically different among
346 regions (Fig. S3).

347 The NPGO index was in the top model of Chinook, coho, sockeye, even- and
348 odd-year pink salmon (Table 1, Fig. 3). High values of the NPGO ($> \sim 1$) were
349 associated with increases in body size in Chinook coho, and sockeye salmon whereas
350 values near zero were related to reductions in body size in all species. NPGO values $<$
351 -1 had variable effects on body size (Fig. 3). The MEI was in the top model of Chinook,
352 chum, sockeye, even-, and odd-year pink salmon (Table 1, Fig. 3). However, there was

353 no consistent relationship between MEI and body size. MEI values close to -0.5 were
354 associated with the greatest reduction of size in Chinook and chum salmon, and
355 positive values, with increases in size (Fig. 3). In contrast, sockeye, even- and odd-year
356 pink salmon were smaller at higher values of MEI (Fig. 3).

357 The biomass of pink salmon from BC, WA, and Alaskan rivers entering the GOA
358 was important in explaining variation in body size of BC even- and odd-year pink
359 salmon. In contrast, Chinook, coho, and chum salmon body sizes were most influenced
360 by the combined biomass of pink, chum, and sockeye salmon (Table 1, Fig. 3). The
361 body size of sockeye salmon was most influenced by the biomass of chum salmon.
362 Including the biomass of chum salmon from Asia in the biomass estimate used in the
363 top model for chum salmon did not improve the model's AICc ($\Delta AICc = 41.33$). The
364 relationship between biomass of competing salmon and body size was variable. High
365 biomass of GOA, BC, and WA salmonids was associated with a reduction in body size
366 in chum and even- and odd-year pink salmon (Fig. 3). In contrast, body size of Chinook,
367 coho, and sockeye salmon increased with high biomass of all GOA, BC, and WA
368 species (Fig. 3).

369

370 **DISCUSSION**

371 Body size of Pacific salmon caught in Canadian waters has varied considerably
372 over the past 60 years. The declines in size of most species observed through the
373 1950s and 1960s have either halted or reversed since then. Although abrupt climatic
374 regime shifts do not appear to have had any consistent or substantial effect on salmon
375 body size, continuous indicators of oceanic conditions contribute to explaining size

376 variation in each species. Density-dependent interactions also appear to be important
377 for all species of Pacific salmon. Latitude did not appear to be important in explaining
378 size variation. However, there might have been evidence for spatial effects if we had
379 considered the full extent of the species ranges, beyond the catch data available to us.

380 It is important to ask whether the changes in body size documented here, which
381 are based on fish caught by commercial fisheries, accurately reflect shifts in body size.
382 We may have underestimated rates of decline if there has been an increasing bias
383 toward capture of larger fish over time, for example due to changes in gear
384 characteristics or regulations. If so, then decreases in body size may have been
385 stronger than shown here, and more recent apparent increases might be less marked
386 than we have shown. The changes in body size of Chinook salmon may be the most
387 likely to be fishery artifacts because there have been significant changes in minimum
388 size regulations in the commercial troll fishery for this species (Supplemental Material).
389 However, we have analyzed data from the least selective gear for each species, which
390 reduces the likelihood of size-based catch biases. Moreover, it is reassuring that fish
391 caught by different commercial fishing gear types exhibited similar trends through time
392 (Fig. S1). In addition, our findings from the earlier part of our time series are generally
393 consistent with trends in body size found in previous studies (Bigler et al. 1996, Eggers
394 and Irvine 2007, Shaul et al. 2007). Consequently, we are confident that our findings
395 indicate true changes in body size.

396 The variation, albeit minimal in some cases, that is explained by oceanic and
397 density-dependent correlates should be highlighted, given the expected noise in our
398 data (see Table 1 for R^2 values). Commercial catch statistics are subject to changes in

399 regulations, gear selectivity, and collection rigour throughout time. Furthermore,
400 changes in body size of Pacific salmon, with the exception of pink salmon, can be
401 confounded by changes in the age at which salmon mature and by the complexity of the
402 system. Our models demonstrate the importance of oceanic and density-dependent
403 influences on salmon body size, which emerges clearly despite the many sources of
404 unaccounted variability in our data.

405

406 **Oceanic Conditions**

407 In general, salmon body size did not exhibit any consistent or substantial change
408 following abrupt ecosystem regime shifts in either the raw data or smoothed trends (Fig.
409 1 and 2, respectively). There is some evidence of an abrupt increase in Chinook size
410 immediately following the 1976/77 regime shift. However, this increase in size occurs
411 prior to the regime shift adjusted for ocean-entry and is not sustained the following year
412 (Fig. 1). This result is perhaps surprising, given previous demonstrations of changes in
413 salmon abundance across regime shifts (Beamish et al. 1999, Hare et al. 1999, Irvine
414 and Fukuwaka 2011), as well as some evidence for associated changes in body size
415 (Helle and Hoffman 1998). However, Litzow and Mueter (2014) argued that the primary
416 axis of biological variability in the North Pacific Ocean changed gradually rather than
417 abruptly following regime shifts. In the case of Pacific salmon and many other fish
418 species, the effects of regime shifts can be spread across multiple years due, in part, to
419 the multi-year lifespan of most species. If regime shifts have a gradual effect on salmon
420 body size then it is better to use climate indices as continuous variables to understand
421 environmental impacts on salmon body size.

422 The best-supported model for each species contained at least two climatic
423 indices (Table 1). These indices capture variation in environmental parameters, such as
424 sea surface temperature, across the geographic scale of salmon marine distributions.
425 The North Pacific Gyre Oscillation (NPGO) emerged in the top model for every species
426 of Pacific salmon except chum salmon (Table 1). The NPGO made a positive
427 contribution to body size of Chinook, chum, and sockeye salmon as it approached and
428 exceeded +1 (Fig. 3). Positive NPGO values correspond to increased net primary
429 productivity (Di Lorenzo et al. 2008) and salmon survival (Kilduff et al. 2015). In contrast,
430 the NPGO made a negative contribution to body size at values close to zero and a
431 variable contribution at values approaching and lower than -1 (Fig. 3). The importance
432 of allowing for non-linear relationships is highlighted here because persistent climate
433 forcing is expected to create non-linear changes in ecosystem dynamics (Smith et al.
434 2009). To the best of our knowledge, the NPGO has never been incorporated into
435 discussions of salmon body size, perhaps due to its recent inception (Di Lorenzo et al.
436 2008). However, our results, combined with the increasing support of the NPGO's
437 influence in the North Pacific Ocean (Di Lorenzo et al. 2008), suggest that it is an
438 important driver of variation in salmon body size.

439 The Multivariate ENSO Index (MEI) was included in the top model for every
440 species of Pacific salmon except coho salmon. While positive values of the MEI
441 correspond to warmer, ENSO-like conditions and a reduction in net primary productivity
442 (Behrenfeld et al. 2006), the MEI does not have a consistent effect on body size across
443 species (Fig. 3; see also Wells et al. 2006, Satterthwaite et al. 2012). For example,
444 Wells et al. (2006) found that the average length of age-3 BC-Puget Sound Chinook

445 salmon was positively correlated with the MEI. Similarly, we found that MEI values close
446 to -0.5 corresponded to the greatest reduction in Chinook salmon body size and positive
447 values were associated with an increase in body size (Fig. 3). The association was
448 similar for chum salmon body size while even-year pink salmon showed a more linear
449 positive correlation with the MEI (Fig. 3). In contrast, Wells et al. (2006) found that the
450 body size of coho salmon returning to BC was negatively correlated with the MEI.
451 Although the MEI was not in our top model for coho salmon (Table 1), we found a
452 similar negative relationship in sockeye and odd-year pink salmon (Fig. 3).

453

454 **Density-dependent Interactions**

455 Density-dependent interactions are important in explaining variation in body size of
456 all species of Pacific salmon. Body size of Chinook, coho, and chum salmon was most
457 influenced by the total biomass of the three most abundant salmon species in the Gulf
458 of Alaska - sockeye, chum, and pink salmon (Table 1, Fig. 3), many of which are of
459 hatchery origin. There is some debate regarding the competitive influence of chum
460 salmon from Asia on salmon from North America (Ruggerone et al. 2012, Irvine and
461 Akenhead 2013). However, our results suggest that competition from Asian chum
462 salmon does not have an additional effect on body size of BC chum salmon, as
463 including them in the biomass estimate of competing salmon did not improve the
464 model's AICc. Intraspecific density-dependent interactions appeared to be more
465 important among pink salmon as pink-only biomass emerged in the top models for body
466 size of both lines of pink salmon (Table 1, Fig. 3). This may be due, in part, to young

467 pink salmon migrating into marine waters prior to most other species and consequently
468 minimizing interspecific competition during this life stage.

469 Surprisingly, the direction of the effect of density-dependent interactions, as
470 estimated by salmon biomass, was variable across species. One might expect that
471 when biomass of competing salmonids is high, the ocean may be near its 'salmon
472 carrying capacity' and density-dependent interactions would limit how large a salmon
473 can grow. This expected negative relationship was found in even- and odd-year pink
474 salmon and chum salmon (Table 1, Fig. 3). However, the relationship is more clearly
475 defined for odd-year than even-year pink salmon, possibly because the higher and
476 increasing abundance of odd-year compared to even-year pink salmon strengthens
477 intraspecific competition within odd-year runs (Irvine et al. 2014). On the other hand,
478 body size of Chinook and coho salmon increased with increasing salmon biomass,
479 suggesting little competitive interactions. Indeed, there is little diet overlap between
480 Chinook or coho salmon and the three other, more abundant species (Welch and
481 Parsons 1993). Instead, this positive relationship may be driven by favourable
482 environmental conditions, which allows for greater total biomass of salmon species and
483 larger size in Chinook and coho salmon.

484

485 **Fishing pressure**

486 There is a growing body of evidence suggesting that fisheries may be responsible
487 for evolutionary changes (e.g., Law 2000, Quinn et al. 2007) and/or plastic changes in
488 fish body size (Price et al. 2003). Fisheries can also alter the age structure of the
489 species that have multiple age classes (Chinook, sockeye and chum salmon). In BC,

490 overall fishing intensity on salmon has decreased in recent years due to conservation
491 concerns. For instance, commercial coho salmon fisheries have been closed in
492 southern BC since 1997 (Irvine et al. 2013). In addition, fisheries for sockeye salmon,
493 especially from the Fraser River watershed, and pink salmon fisheries (odd and even
494 years) have been substantially reduced in recent years (Irvine et al. 2014). Furthermore,
495 Chinook and coho salmon fishing effort throughout BC has been shifting away from the
496 commercial fleet to the recreational fishery (DFO 1999). This decrease in selection
497 pressure from the various fisheries could have led to some increase in salmon body
498 size. However, we would expect this rebound to still fall short of 1950s values because
499 such recoveries can take much longer than that. Kuparinen and Hutchings (2012), for
500 example, demonstrated that size at maturity of a simulated Atlantic cod (*Gadus morhua*)
501 population would still be 11% lower than pre-fishing sizes 200 years after fishing ceased.
502 Admittedly, cod has a longer generation time than salmon, so relaxation of fishing
503 pressure might still have played a role in the recovery of salmon body size, but it is
504 perhaps less important than the ecological and climatic effects that we have shown here.

505 In conclusion, this study updated changes in body size of Pacific salmon caught
506 in Canadian waters and provided evidence of climatic and density-dependent
507 explanations for these trends. Rapid reductions in body size of some species of Pacific
508 salmon from the 1950s through the 1970s or 1980s have either halted or, in the case of
509 Chinook and coho salmon, completely reversed. While the role of fisheries-induced
510 selection in driving these patterns is unclear, the changes in salmon body size are
511 correlated with variation in ocean conditions and density-dependent competition with
512 other salmon.

513

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523

524 **REFERENCES**

525

526 Agler, B.A., Ruggerone, G.T., Wilson, L.I., and Mueter, F.J. 2013. Historical growth of
527 Bristol Bay and Yukon River, Alaska chum salmon (*Oncorhynchus keta*) in relation to
528 climate and inter- and intraspecific competition. Deep. Sea Res., Part II. **94**: 165-177.
529 doi:10.1016/j.dsr2.2013.03.028.

530 Allendorf F.W., and Hard J.J. 2009. Human-induced evolution caused by unnatural
531 selection through harvest of wild animals. Proc. Natl. Acad. Sci. U. S. A. **106**: 9987-
532 9994. doi:10.1073/pnas.091069106.

533 Audzijonyte, A., Kuparinen, A., Gorton, R., Fulton, E.A. 2013. Ecological consequences
534 of body size decline in harvested fish species: positive feedback loops in trophic
535 interactions amplify human impact. Biol. Lett. **9**: 20121103. doi:
536 10.1098/rsbl.2012.1103.

537 Baker, M.R., Kendall, N.W., Branch, T.A., Schindler, D.E., and Quinn, T.P. 2011.
538 Selection due to nonretention mortality in gillnet fisheries for salmon. Evol. Appl. **4**:
539 429-443. doi:10.1111/j.1752-4571.2010.00154.x.

540 Beamish, R.J., Noakes, D.J., McFarlane, G.A., Klyashtorin, L., Ivanov, V.V., and
541 Kurashov, V. 1999. The regime concept and natural trends in the production of
542 Pacific salmon. Can. J. Fish. Aquat. Sci. **56**(3): 516-526. doi: 10.1139/f98-200.

543 Behrenfeld, M.J., O'Malley, R.T, Siegel, D.A., McClain, C.R., Sarmiento, J.L., Feldman,
544 G.C., Milligan, A.J., Falkowski, P.G., Letelier, R.M., and Boss, E.S. 2006. Climate-

- 545 driven trends in contemporary ocean productivity. *Nat.* **444**: 752-5.
546 doi:10.1038/nature05317.
- 547 Bigler, B.S., Welch, D.W., and Helle, J.H. 1996. A review of size trends among North
548 Pacific salmon (*Oncorhynchus spp.*). *Can. J. Fish. Aquat. Sci.* **53**: 455-465.
549 doi:10.1139/f95-181
- 550 Blueweiss, L., Fox, H., Kudzma, V., Nakashima, D., Peters, R., and Sams, S. 1978.
551 Relationships between body size and some life history parameters. *Oecologia* **37**:
552 257-272. doi:10.1007/BF00344996
- 553 Bugaev, V.F., Welch, D.W., Selifonov, M.M., Grachev L.E., and Eveson, J.P. 2001.
554 Influence of the marine abundance of pink (*Oncorhynchus gorbuscha*) and sockeye
555 salmon (*O. nerka*) on growth of Ozernaya River sockeye. *Fisheries Oceanography*.
556 **10**(1): 26-32. doi:10.1046/j.1365-2419.2001.00150.x
- 557 Burnham, K. P., and Anderson. D. R. 2002. Model selection and multimodel inference: a
558 practical information-theoretic approach, 2nd edition. Springer-Verlag, New York.
- 559 Calder, W.A. 1984. Size, function, and life history. Harvard University Press. Cambridge,
560 Mass.
- 561 Conover, D.O., and Munch, S.B. 2002. Sustaining fisheries yields over evolutionary time
562 scales. *Science*. **297**(5578): 94-96. doi:10.1126/science.1074085.
- 563 Crozier, L.G., Hutchings, J.A. 2014. Plastic and evolutionary responses to climate
564 change in fish. *Evol. Appl.* **7**(1): 68-87. doi: 10.1111/eva.12135

- 565 DFO (Fisheries and Oceans Canada). 1999. An allocation policy for Pacific salmon.
566 Available from <http://www.dfo-mpo.gc.ca/Library/240366.pdf> [accessed 18 December
567 2015).
- 568 DFO (Fisheries and Oceans Canada). 2009. Revisions to official DFO commercial
569 Pacific Salmon catch estimates for 1996-2004. Canadian Science Advisory
570 Secretariat Science Advisory Report No. 031. Available from <http://www.dfo-mpo.gc.ca/Library/338513.pdf> [Accessed 18 December 2015].
571
- 572 Di Lorenzo, E., Schneider, N., Cobb, K.M., Franks, P.J.S., Chhak, K., Miller, A.J.,
573 McWilliams, J.C., Bograd, S.J., Arango, H., Curchitser, E., Powell, T.M., and Rivière,
574 P. 2008. North Pacific Gyre Oscillation links ocean climate and ecosystem change.
575 *Geophys. Res. Lett.* **35**(8): L08607. doi: 10.1029/2007GL032838.
- 576 Eggers, D.M. 2009. Historical biomass of pink, chum, and sockeye salmon in the North
577 Pacific Ocean. *Am. Fish. Soc. Symp.* **70**: 267-305.
- 578 Eggers, D.M., and Irvine, J.R. 2007. Trends in abundance and biological characteristics
579 for North Pacific Sockeye Salmon. *N. Pac. Anadr. Fish Comm. Bull.* **4**:53-75.
- 580 Gardner, J.L., Peters, A., Kearney, M.R., Joseph, L., and Heinsohn, R. 2011. Declining
581 body size: a third universal response to warming? *Trends in Ecology and Evolution.*
582 **26**(6): 285-291. doi:10.1016/j.tree.2011.03.005.
- 583 Carstensen, J. 2014. Ecosystem Trajectories: A Statistical Approach to Analyze
584 Changing Pressure-Response Relationships Over Time. *In* Application of threshold
585 concepts in natural resource decision making. *Edited by* Guntenspergen, G. R. New

- 586 York, NY: Springer New York. pp. 262
- 587 Hamon, T.R., Foote, C.J., Hilborn, R., and Rogers D.E. 2000. Selection on morphology
588 of spawning wild sockeye salmon by a gill-net fishery. *Trans. Am. Fish. Soc.* **129**:
589 1300-1315. doi: 10.1577/1548-8659(2000)129<1300:SOMOSW>2.0.CO;2
- 590 Hard, J.J., Gross, M.R, Heino, M., Hilborn, R., Kope, R.G, Law, R., and Reynolds, J.D.
591 2008. Evolutionary consequences of fishing and their implications for salmon. *Evol.*
592 *Appl.* **1**(2): 388-408. doi:10.1111/j.1752-4571.2008.00020.x.
- 593 Hare, S.R., Mantua, N.J., and Francis, R.C. 1999. Inverse production regimes: Alaska
594 and west coast Pacific salmon. *Fisheries.* **24**(1):6-14. doi: 10.1577/1548-
595 8446(1999)024<0006:IPR>2.0.CO;2.
- 596 Hastie, T.J., and Tibshirani, R.J. 1990. Generalized additive models. Monography on
597 statistics and applied probability 43. Chapman and Hall/CRC, New York.
- 598 Haugen, T.O., and Vøllestad, L.A. 2001. A century of life-history evolution in grayling.
599 *Genetica.* **112**(1): 475-491. doi:10.1023/A:1013315116795.
- 600 Healey, M.C. 1980. The ecology of juvenile salmon in Georgia Strait, British
601 Columbia. *In* Salmonid ecosystems of the North Pacific. *Edited by* W.J. McNeil and
602 D.C. Himsworth. Oregon State University Press, Corvallis, Oreg. pp. 203–229.
- 603 Helle, J.H., and Hoffman, M.S. 1998. Changes in size and age at maturity of two North
604 American stocks of chum salmon (*Oncorhynchus keta*) before and after a major
605 regime shift in the North Pacific Ocean. *N. Pac. Anadr. Fish Comm. Bull.* **1**: 81-89.

- 606 Available from
607 [http://www.npafc.org/new/publications/Bulletin/Bulletin%20No.%201/page%2081-](http://www.npafc.org/new/publications/Bulletin/Bulletin%20No.%201/page%2081-89(Helle).PDF)
608 [89\(Helle\).PDF](http://www.npafc.org/new/publications/Bulletin/Bulletin%20No.%201/page%2081-89(Helle).PDF) [accessed 9 December 2015].
- 609 Helle, J.H., Martinson, E.C., Eggers, D.M., and Gritsenko, O. 2007. Influence of salmon
610 abundance and ocean conditions on body size of Pacific salmon. *N. Pac. Anadr. Fish*
611 *Comm. Bull.* **4**: 289-298. Available from
612 [http://www.npafc.org/new/publications/Bulletin/Bulletin%20No.%204/289-](http://www.npafc.org/new/publications/Bulletin/Bulletin%20No.%204/289-298Helle.pdf)
613 [298Helle.pdf](http://www.npafc.org/new/publications/Bulletin/Bulletin%20No.%204/289-298Helle.pdf) [accessed 9 December 2015].
- 614 Hutchings, J.A., and Fraser, D.J. 2008. The nature of fisheries and farming-induced
615 evolution. *Mol. Ecol.* **17**: 294-313. doi:10.1111/j.1365-294X.2007.03485.x.
- 616 Hyer, K., and Schleusner, C.J. 2005. Chinook salmon age, sex, and length analysis
617 from selected escapement projects on the Yukon river. Alaska Fisheries Technical
618 Report Number 87, US Fish and Wildlife Service, Office of Subsistence Management,
619 Fisheries Information Services Division.
- 620 Irvine, J.R. and Akenhead, S.A. 2013. Understanding smolt survival trends in sockeye
621 salmon. *Mar. Coast. Fish. Dyn. Manage. Ecosyst. Sci.* **5**(1): 303-328. doi:
622 [10.1080/19425120.2013.831002](https://doi.org/10.1080/19425120.2013.831002).
- 623 Irvine, J.R, and Fukuwaka, M. 2011. Pacific salmon abundance trends and climate
624 change. *ICES J. Mar. Sci.* **68**(6): 1122-1130. doi:10.1093/icesjms/fsq199.
- 625 Irvine, J.R., O'Neill, M., Godbout, L., and Schnute, J.. 2013. Effects of smolt release
626 timing and size on the survival of hatchery-origin coho salmon in the Strait of Georgia.

- 627 Prog. Oceanogr. **115**: 111-118. doi: 10.1016/j.pocean.2013.05.014
- 628 Irvine, J.R., Michielsens, C.J.G., O'Brien, M., White, B., and Folkes, M. 2014. Increasing
629 dominance of odd-year returning pink salmon. Trans. Am. Fish. Soc. **143**(4): 939-956.
630 doi:10.1080/00028487.2014.889747.
- 631 Irvine, J.R. and G.T. Ruggione. 2016. Provisional estimates of numbers and biomass
632 for natural-origin and hatchery-origin pink, chum, and sockeye salmon in the North
633 Pacific, 1952-2015. NPAFC Doc. 1660. 45 pp.
- 634 Kilduff, D.P., Di Lorenzo, E., Botsford, L.W., and Teo, S.L.H. 2015. Changing central
635 Pacific El Niños reduce stability of North American salmon survival rates. Proc. Natl.
636 Acad. Sci. **112**(35): 10962-10966. doi:10.1073/pnas.1503190112.
- 637 Kuparinen, A., and Hutchings, J.A. 2012. Consequences of fisheries-induced evolution
638 for population productivity and recovery potential. Proc. R. Soc. B. **279**: 2571-2579.
639 doi:10.1098/rspb.2012.0120.
- 640 Law, R.I. 2000. Fishing, selection, and phenotypic evolution. ICES J. Mar. Sci. **57**: 659-
641 668. doi: 10.1006/jmsc.2000.0731.
- 642 Law, R.I. 2001. Phenotypic and genetic changes due to selective exploitation. *In*
643 Conservation of Exploited Species. Edited by Reynolds, J.D., Mace, G.M., Redford,
644 K.H., and Robinson, J.G. Cambridge University Press, Cambridge. pp. 323-342.
- 645 Lin, X., and Zhang, D. 1999. Inference in generalized additive mixed models by using
646 smoothing splines. J. R. Statist. Soc. B. **61**(2): 381-400. doi: 10.1111/1467-

- 647 9868.00183.
- 648 Litzow, M.A., and Mueter, F.J. 2014. Assessing the ecological importance of climate
649 regime shifts: An approach from the North Pacific Ocean. *Prog. Oceanogr.* **120**: 110-
650 119. doi: 10.1016/j.pocean.2013.08.003.
- 651 Litzow, M.A., Mueter, F.J., and Hobday, A.J. 2014. Reassessing regime shifts in the
652 North Pacific: incremental climate change and commercial fishing are necessary for
653 explaining decadal-scale biological variability. *Glob. Change Biol.* **20**: 38-50. doi:
654 10.1111/gcb.12373.
- 655 Mantua, N.J., Hare, S.R., Zhang, Y., Wallace, J.M., and Francis, R.C. 1997. A Pacific
656 interdecadal climate oscillation with impacts on salmon production. *Bull. Am.*
657 *Meteorol. Soc.* **78**(6): 1069-1079. doi:10.1175/1520-
658 0477(1997)078<1069:APICOW>2.0.CO;2
- 659 Miller, J.A., Teel, D.J., Peterson, W.T., and Baptista, A.M. 2014. Assessing the relative
660 importance of local and regional processes on the survival of a threatened salmon
661 population. *PLoS One.* **9**(6): e99814. doi:10.1371/journal.pone.0099814.
- 662 Myers, K.W., Klovach, N.V., Gritsenko, O.F., Urawa, S., and Royer, T.C. 2007. Stock-
663 specific distributions of Asian and North American salmon in the open ocean,
664 interannual changes, and oceanographic conditions. *N. Pac. Anadr. Fish Comm. Bull*
665 **4**: 159-177. Available from
666 [http://www.npafc.org/new/publications/Bulletin/Bulletin%20No.%204/159-](http://www.npafc.org/new/publications/Bulletin/Bulletin%20No.%204/159-177Myers.pdf)
667 [177Myers.pdf](http://www.npafc.org/new/publications/Bulletin/Bulletin%20No.%204/159-177Myers.pdf) [Accessed 18 December 2015].

- 668 Ohlberger, J. 2013. Climate warming and ectotherm body size - from individual
669 physiology to community ecology. *Functional Ecology*. **27**: 991-1001.
670 doi:10.1111/1365-2435.12098.
- 671 Pacific Salmon Commission. 1994. Interim estimates of coho stock composition for
672 1984-1991 southern area fisheries and for 1987-1991 northern panel area fisheries.
673 Pacific Salmon Commission Coho Technical Committee Report TCCOHO (94)-1.
674 Pacific Salmon Commission, Vancouver, British Columbia.
675 http://www.psc.org/publications_tech_techcommitteereport.htm
- 676
677 Pacific Salmon Commission. 2015. 2014 Exploitation rate analysis and model
678 calibration. Joint Chinook Technical Committee Report TCCHINOOK(15)-1 V.1,
679 Pacific Salmon Commission, Vancouver, British Columbia.
680 http://www.psc.org/publications_tech_techcommitteereport.htm
- 681 Pauli, B., and Heino, M. 2014. What can selection experiments teach us about
682 fisheries-induced evolution? *Biol. J. Linn. Soc.* **111**: 485-503. doi: 10.1111/bij.12241.
- 683 Peters, R.H. 1983. *The ecological implications of body size*. Cambridge University
684 Press, Cambridge [Cambridgeshire], New York.
- 685 Polovina, J.J. 2005. Climate variation, regime shifts, and implications for sustainable
686 fisheries. *Bull. Mar. Sci.* 76(2): 233-244. Available from
687 [http://www.ingentaconnect.com/content/umrsmas/bullmar/2005/00000076/00000002/](http://www.ingentaconnect.com/content/umrsmas/bullmar/2005/00000076/00000002/art00005)
688 [art00005](http://www.ingentaconnect.com/content/umrsmas/bullmar/2005/00000076/00000002/art00005) [accessed 9 December 2015].

- 689 Price, T.D., Qvarnström, A., and Irwin, D.E. 2003. The role of phenotypic plasticity in
690 driving genetic evolution. *Proc. R. Soc. B.* **270**: 1433-1440.
691 doi:10.1098/rspb.2003.2372.
- 692 Quinn, T.P., Hodgson, S., Flynn, L., Hilborn, R., and Rogers, D.E. 2007. Directional
693 selection by fisheries and the timing of sockeye salmon (*Oncorhynchus nerka*)
694 migrations. *Ecol. Appl.* **17**(3): 731-739. doi:10.1890/06-0771.
- 695 Ricker, W.E. 1980a. Causes of the decrease in age and size of Chinook salmon
696 (*Oncorhynchus tshawytscha*). *Can. Tech. Rep. Fish. Aquat. Sci.* No. 944.
- 697 Ricker, W.E. 1980b. Changes in the age and size of chum salmon (*Oncorhynchus keta*).
698 *Can. Tech. Rep. Fish. Aquat. Sci.* No. 930.
- 699 Ricker, W.E. 1981. Changes in the Average Size and Average Age of Pacific Salmon.
700 *Can. J. Fish. Aquat. Sci.* **38**: 1636-1656. doi:10.1139/f81-213.
- 701 Ricker, W.E. 1982. Size and age of British Columbia sockeye salmon (*Oncorhynchus*
702 *nerka*) in relation to environmental factors and the fishery. *Can. Tech. Rep. Fish.*
703 *Aquat. Sci.* No. 1115.
- 704 Ricker, W.E. 1995. Trends in average size of Pacific salmon in Canadian catches. *In*
705 *Climate change and northern fish populations. Edited by R.J. Beamish. Can. Spec.*
706 *Publ. Fish. Aquat. Sci.* pp. 593-602.
- 707 Ricker, W.E., and Wickett, W.P. 1980. Causes of the decrease in size of coho salmon
708 (*Oncorhynchus kisutch*). *Can. Tech. Rep. Fish. Aquat. Sci.* No. 971.

- 709 Ricker, W.E., Bilton, H.T., and Aro, K.V. 1978. Causes of the decrease in size of pink
710 salmon (*Oncorhynchus gorbuscha*). Tech. Rep. - Fish. Mar. Serv. (Can.) No. 820.
- 711 Ruggerone, G.T. and Irvine, J.R.. 2015. Provisional abundance estimates of adult
712 hatchery and wild pink, chum, and sockeye salmon by region of the north pacific,
713 1952-2010. N. Pac. Anadr. Fish. Comm. Doc. No. 1594. Available from
714 [http://www.npafc.org/new/publications/Documents/PDF%202015/1594\(USA+Canada](http://www.npafc.org/new/publications/Documents/PDF%202015/1594(USA+Canada).pdf)
715 [\).pdf](http://www.npafc.org/new/publications/Documents/PDF%202015/1594(USA+Canada).pdf) [Accessed 18 December 2015].
- 716 Ruggerone, G.T., and Nielsen, J.L. 2004. Evidence for competitive dominance of pink
717 salmon (*Oncorhynchus gorbuscha*) over other salmonids in the North Pacific Ocean.
718 Rev. Fish Biol. Fisher. **14**: 371-390. doi: 10.1007/s11160-004-6927-0.
- 719 Ruggerone, G.T., Nielsen, J.L., and Bumgarner, J. 2007. Linkages between Alaskan
720 sockeye salmon abundance, growth at sea, and climate, 1955-2002. Deep. Sea Res.,
721 Part II. **54**: 2776-2793. doi: 10.1016/j.dsr2.2007.08.016.
- 722 Ruggerone, G.T., Agler, B.A., and Nielsen, J.L. 2012. Evidence for competition at sea
723 between Norton Sound chum salmon and Asian hatchery chum salmon. Environ. Biol.
724 Fishes. **94**: 149-163. doi:10.1007/s10641-011-9856-5.
- 725 Satterthwaite, W.H., Mohr, M.S., O'Farrell, M.R., and Wells, B.K. 2012. A Bayesian
726 hierarchical model of size-at-age in ocean-harvested stocks — quantifying effects of
727 climate and temporal variability. Can. J. Fish. Aquat. Sci. **69**: 942-954. doi:
728 10.1139/f2012-036.
- 729 Schabenberger, O., and Pierce, F.J. 2001. Contemporary statistical models for the plant

- 730 and soil sciences. CRC press, Boca Raton, F.L.
- 731 Schwing, F.B., Murphree, T., and Green, P.M. 2002. The Northern Oscillation Index
732 (NOI): a new climate index for the northeast Pacific. Prog. Oceanogr. **53**: 115-139.
733 doi:10.1016/S0079-6611(02)00027-7.
- 734 Sebens, K. 1987. The ecology of indeterminate growth in animals. Annu. Rev. Ecol.
735 Syst. **18**: 371-407. doi: 10.1146/annurev.es.18.110187.002103.
- 736 Shaul, L., Weitkamp, L., Simpson, K., and Sawada, J. 2007. Trends in abundance and
737 size of coho salmon in the Pacific Rim. N. Pac. Anadr. Fish Comm. Bull. **4**: 93–104.
738 Available from
739 [http://www.npafc.org/new/publications/Bulletin/Bulletin%20No.%204/093-](http://www.npafc.org/new/publications/Bulletin/Bulletin%20No.%204/093-104Shaul.pdf)
740 [104Shaul.pdf](http://www.npafc.org/new/publications/Bulletin/Bulletin%20No.%204/093-104Shaul.pdf) [Accessed 18 December 2015].
- 741 Smith, M.D., Knapp, A.K, and Collins, S.L. 2009. A framework for assessing ecosystem
742 dynamics in response to chronic resource alterations induced by global change.
743 Ecology. **90**(12): 3279-3289. doi:10.1890/08-1815.1.
- 744 Urawa, S., Sato, S., Crane, P.A., Agler, B., Josephson, R., and Azumaya, T. 2009.
745 Stock-specific ocean distribution and migration of chum salmon in the Bering Sea
746 and North Pacific Ocean. N. Pac. Anadr. Fish Comm. Bull. **5**: 131-146.
- 747 Welch, D.W. and Parson, T.R. 1993. $\delta^{13}\text{C}$ - $\delta^{15}\text{N}$ values as indicators of trophic position
748 and competitive overlap for Pacific salmon (*Oncorhynchus* spp.). Fish. Oceanogr.
749 **2**(1): 11-23. doi:10.1111/j.1365-2419.1993.tb00008.x

- 750 Wells, B.K., Grimes, C.B., Field, J.C., and Reiss, C.S. 2006. Covariation between the
751 average lengths of mature coho (*Oncorhynchus kisutch*) and Chinook salmon (*O.*
752 *tshawytscha*) and the ocean environment. *Fish. Oceanogr.* **15**(1): 67-79.
753 doi:10.1111/j.1365-2419.2005.00361.x.
- 754 Wertheimer, A.C., Heard, W.R., Maselko, J.M., and Smoker, W.W. 2004. Relationship
755 of size at return with environmental variation, hatchery production, and productivity of
756 wild pink salmon in Prince William Sound, Alaska: does size matter? *Rev. Fish Biol.*
757 *Fisher.***14**: 321-334. doi:10.1007/s11160-004-2942-4.
- 758 Wolter, K., and Timlin, M.S. 1998. Measuring the strength of ENSO events: How does
759 1997/98 rank? *Weather.* **53**(9): 315-324. doi:10.1002/j.1477-8696.1998.tb06408.x.
- 760 Yeh, S-W., Kang, Y-J., Noh, Y., and Miller, A.J. 2011. The North Pacific climate
761 transitions of the winters of 1976/77 and 1988/89. *J. Clim.* **24**: 1170-1183. doi:
762 10.1175/2010JCLI3325.1.
- 763 Zuur, A.F., Ieno, E.N., and Smith, G.M. 2007. *Analysing ecological data.* Springer-
764 Verlag, New York.

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768 Table 1. Second-order Akaike information criterion (AICc) model selection results for the top GAMMs constructed for
 769 each Pacific salmon species. The full model includes four climatic indices (NPGO, PDO, MEI, NOI), estimates of the
 770 biomass of salmon from rivers entering the GOA, BC, and WA (combined sockeye, chum and pink salmon, pink salmon
 771 only, or chum salmon only; only one per model) and latitude. + indicates the variables included in each model. Only the
 772 models with $\Delta\text{AICc} < 2$ are shown. ΔAICc is the difference in AICc values between each model and the best-supported
 773 models. Weight is a measure of the relative likelihood of each model given the set of candidate models. The adjusted R^2
 774 indicates the explanatory power of the model adjusted for the number of predictors in the model.

775

	Model No	NPGO	PDO	NOI	MEI	Biomass	Biomass Metric	Latitude	df	AICc	ΔAICc	Weight	Adjusted R^2
Chinook	1	+	+	+	+	+	pink + sock + chum		14	2148.69	0.00	0.38	0.21
	2	+	+		+	+	pink + sock + chum		12	2148.94	0.26	0.34	0.22
Coho	1	+		+		+	pink + sock + chum		13	976.62	0.00	0.38	0.16
	2	+		+	+	+	pink + sock + chum		15	978.45	1.83	0.15	0.18
Chum	1			+	+	+	pink + sock + chum		10	1158.78	0.00	0.45	0.23
	2	+		+	+	+	pink + sock + chum		12	1160.03	1.24	0.24	0.23

Sockeye	1	+	+		+	+	chum	14	20.94	0.00	0.35	0.10
	2	+			+	+	chum	12	21.64	0.71	0.25	0.08
Pink	1	+	+	+	+	+	pink	16	-129.51	0.00	0.47	0.40
even year	2	+	+		+	+	pink	14	-129.31	0.20	0.43	0.37
Pink	1	+	+	+	+	+	pink	14	-136.00	0.00	0.75	0.70
odd year												

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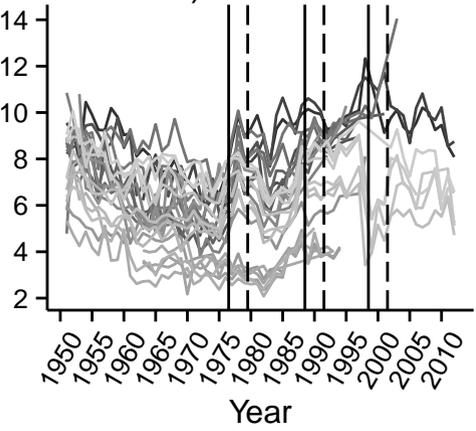
777 **Figure Captions**

778 Figure 1. Mean weight (kg) of Pacific salmon from 1950 to 2012 by statistical area (grey
779 lines) caught with the least selective gear type for each species (pink, chum, sockeye =
780 seine; Chinook and coho = troll). Vertical lines indicate the calendar year (solid) and the
781 year adjusted for ocean entry (dashed) of three well-studied ecosystem regime shifts
782 characterized by abrupt changes in marine community composition.

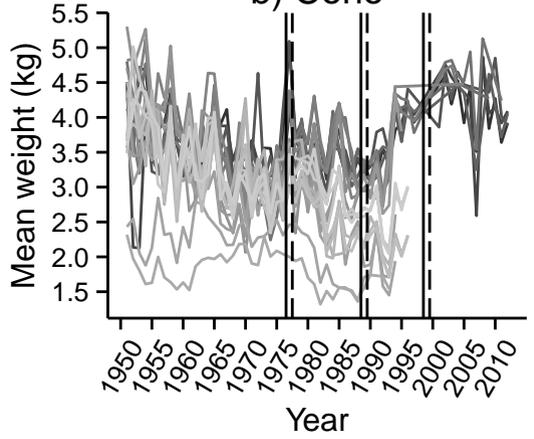
783
784
785 Figure 2. Locally weighted polynomial regressions of mean weight (kg) of Pacific
786 salmon caught by the least selective gear for each species (pink, chum, sockeye =
787 seine; Chinook and coho = troll) across all statistical areas. Grey areas are 95%
788 confidence intervals of the mean across all statistical areas. Vertical lines indicate the
789 calendar year (solid) and the year adjusted for ocean entry (dashed) of three well-
790 studied ecosystem regime shifts characterized by abrupt changes in marine community
791 composition.

792
793 Figure 3. Partial plots illustrating the nature of the relationship between the smoothed
794 predictor (i.e., the explanatory variable) and the residualized dependent variable (i.e.,
795 body size after removing the effect of all other predictor variables) for each variable
796 included in the top model constructed for each salmon species. The Y-axis is mean
797 centered and thus the plots represent how body size changes relative to its mean for a
798 given explanatory variable. Grey bands represent 95% confidence intervals. Tick marks
799 along the bottom of each plot indicate the number of data points for each value of X.

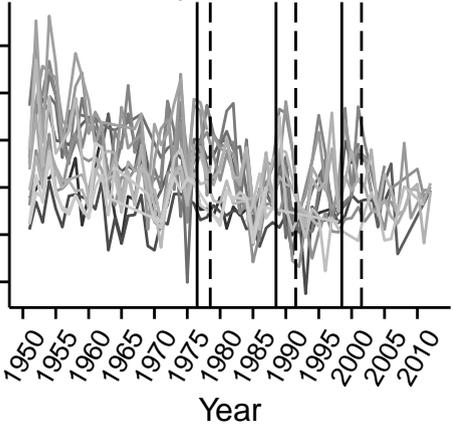
a) Chinook



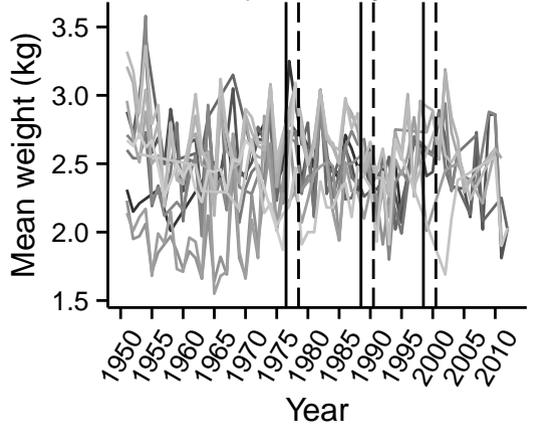
b) Coho



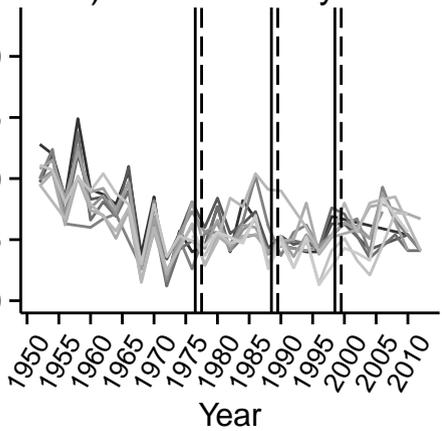
c) Chum



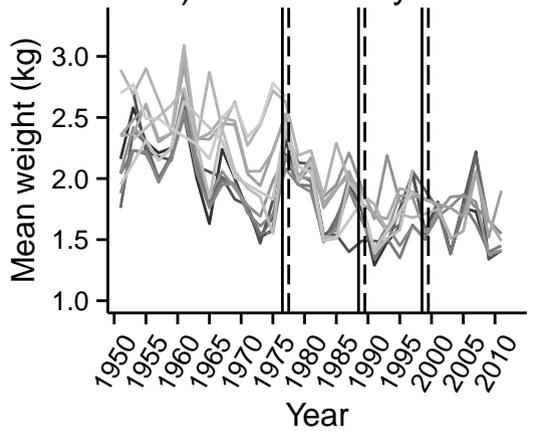
d) Sockeye

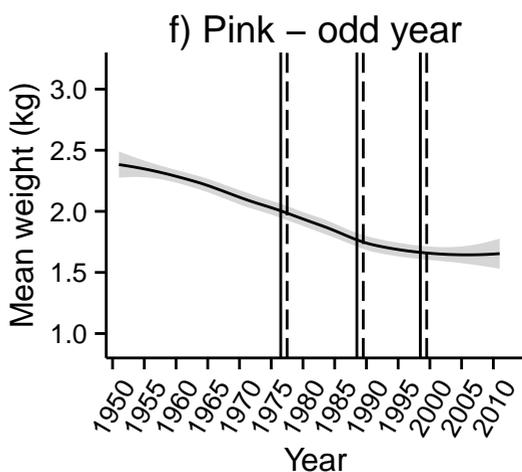
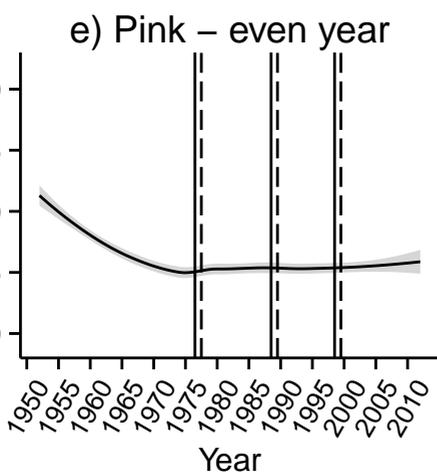
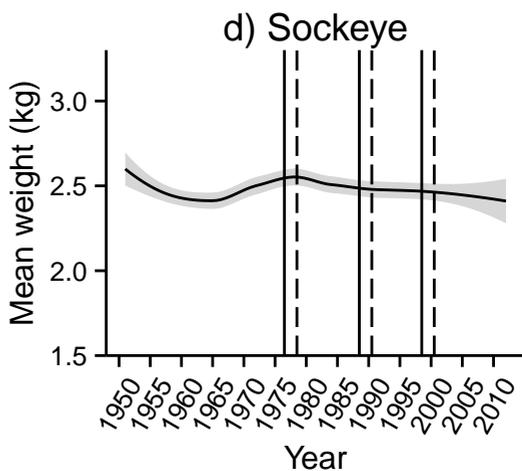
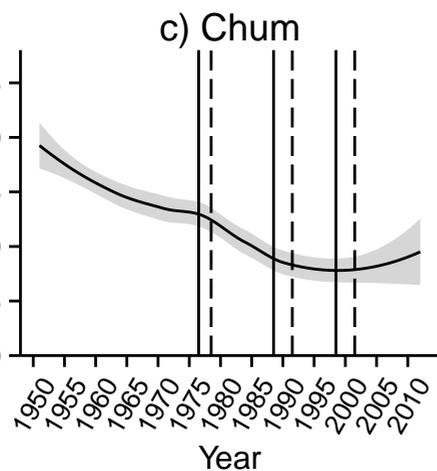
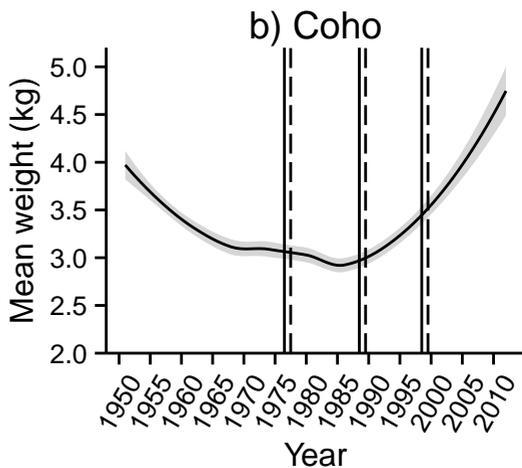
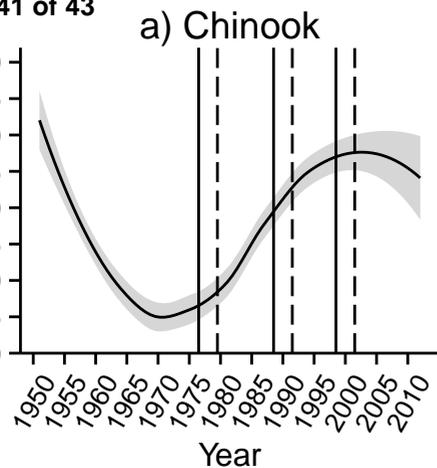


e) Pink – even year

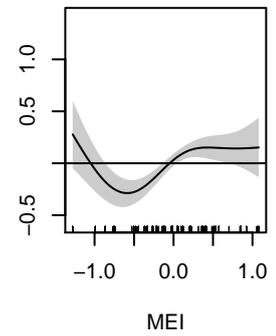
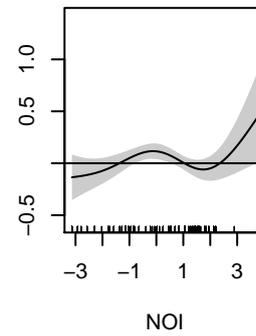
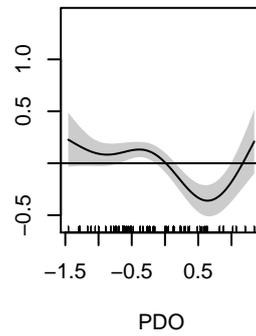
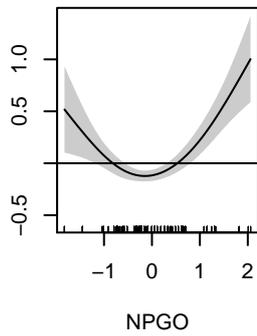
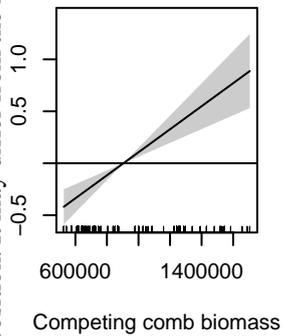


f) Pink – odd year

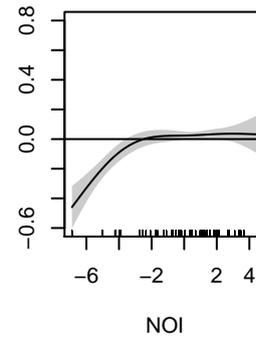
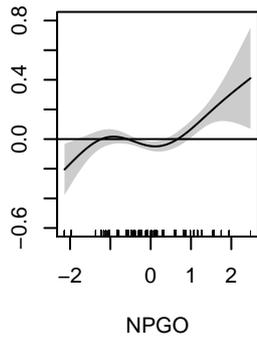
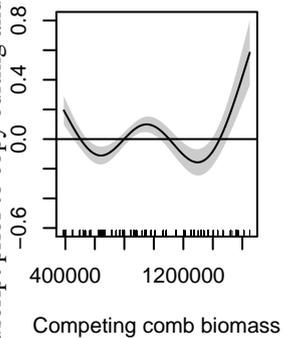




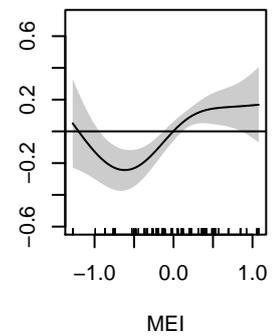
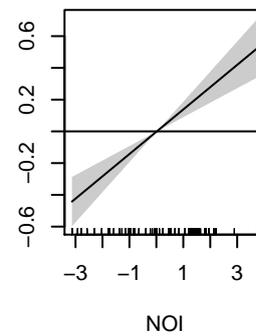
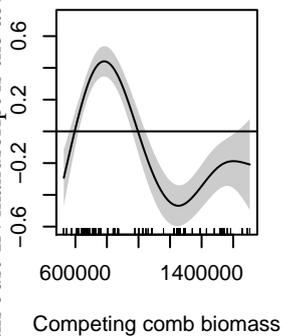
Chinook



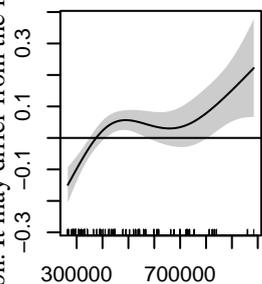
Coho



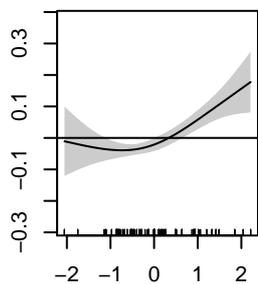
Chum



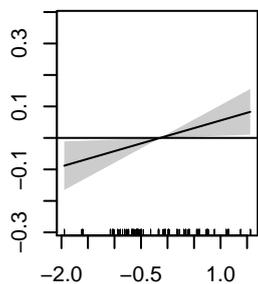
Socketeye



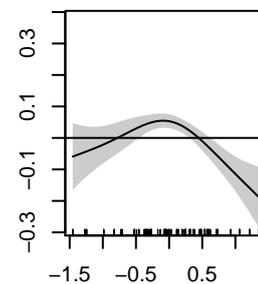
Competing chum biomass



NPGO

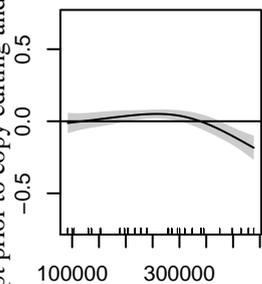


PDO

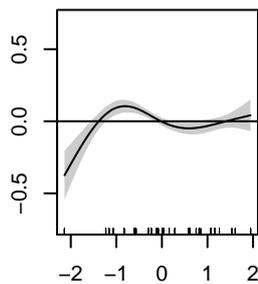


MEI

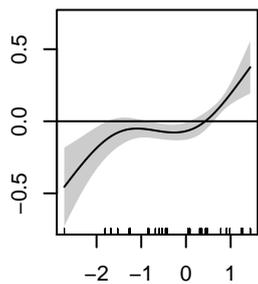
Pink - even year



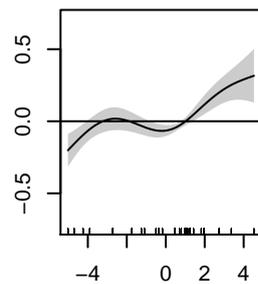
Competing pink biomass



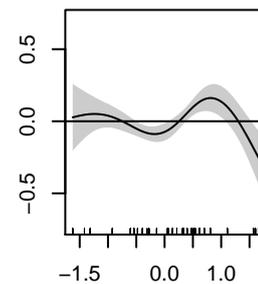
NPGO



PDO

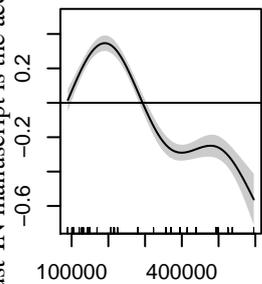


NOI

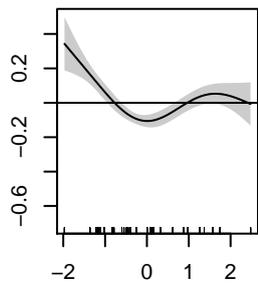


MEI

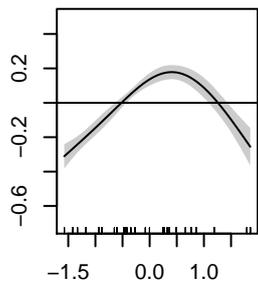
Pink - odd year



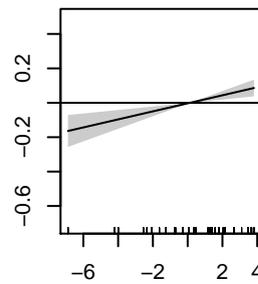
Competing pink biomass



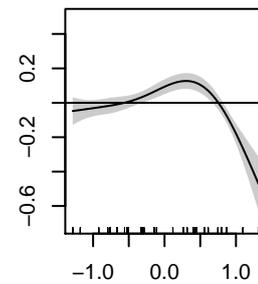
NPGO



PDO



NOI



MEI